

Entropy, Irreversibility and Probability in chaotic systems

Irreversibility became central to thermodynamics after Carnot's theorem determining the maximum efficiency η_{max} of a thermic machine: and η_{max} could not be reached as it had to work *reversibly*, hence infinitely slow.[1]

Carnot's theorem (1824) led Clausius (1850-1865) to introduce **entropy** and to formulate the **II principle** of Therm. relying on Carnot's theorem, which implied the possibility of defining **entropy variation** between equilibrium states A and B . [2, 3, 4].

Just construct a **reversible transf.** from A to B and add up the amounts of heat absorbed from external reservoirs divided by the respective absolute temperature, that by the time had been identified with the system **average kinetic energy**. [5]:

$$S(B) - S(A) = \sum \frac{Q_i}{T_i}$$

Atomists immediately asked for the **mechanical meaning** of entropy. Boltzmann (1866) proposed a **probabilistic interpretation**: observables, in equilibrium, have values which are actually averages of (often rapidly) changing instantaneous values.

Therefore an equil. state can be identified with the average values of the observables.

His first hypothesis supposed that the **microscopic motion is periodic**: and an equilibrium state could be identified with a single periodic trajectory. The averages would simply be deduced via the **fraction of time spent in a segment** of the periodic trajectory, viewed as a closed path in **phase space** (*i.e.* space points \equiv set of molecules coordinates).

The assumption might seem surprising, but B. shewed that a well known mechanical property, namely the **principle of least action**, implied that the action

$$S(A) = \oint_A \vec{p} \cdot d\vec{q}$$

of the periodic trajectory had variations between A and B **independent of the transformation**, provided it took place so slowly that at every time it could be considered periodic.

The function S was identified with the entropy because interpreting average kinetic energy as temperature and calling dL the average work reversibly performed by the **external forces** it followed that the variation of the internal energy dU had the **thermodynamic property**

$$\frac{dU + dL}{T} = dS$$

thus justifying the interpretation as **Clausius' entropy**.

By 1868 he had **completely founded modern Statistical Mechanics** and introduced the *microcanonical ensemble*. Periodicity had become the **ergodic hypothesis**.

Periodic microscopic motions **were replaced** by a probability distribution (1868) describing an equil. state in the form

$$\rho(\vec{p}, \vec{q}) d\vec{p} d\vec{q}$$

and “therefore” in a motion going close to all phase space points (*i.e.* being dense) ρ had to be **positive and invariant**: hence a function of the energy H .

B. did not think about the possibility that other constants of motion exist (aside obvious exceptions) and may be not smooth: and existence of only one smooth const. of motion is the modern definition of ergodicity of a mech. system with conservative forces.

B. tried to illustrate this point by giving an example.

Probably continuing to think so, he proceeded to show that the same system could be described by very different probability distributions provided contained in a large volume V and the interesting observables depended on the particles in a region $\Lambda \subset V$ much smaller (*local observables*).

Is it possible to carry the program of B. to nonequilibrium phenomena? What about friction and irreversibility?

The first difficulty, even restricting attention to stationary states, is that in non equilibrium there are external forces which perform work generating heat and heat has to be removed. So dissipation is present.

In the equations of motion $\dot{x}_i = f_i(x)$ dissipation appears because, Liouville's theorem, a volume element dx evolves in time dt into a volume element $dx' = (1 + \text{div} \cdot dt)dx$ with $\text{div} = \sum_i \frac{\partial f_i(x)}{\partial x_i}$ and typically $\text{div} < 0$ and $dx' < dx$.

For instance in the **incompressible Navier-Stokes** eq., for simplicity in container with periodic b.c. $[0, 2\pi]^d$, $d = 2, 3$, velocity is $\mathbf{u}(\mathbf{x})$ represented via Fourier's transf.

$$\mathbf{u}(\mathbf{x}) = \sum_{\mathbf{k} \neq \mathbf{0}} \mathbf{u}_{\mathbf{k}} e^{2\pi i \mathbf{k} \cdot \mathbf{x}}, \quad \mathbf{u}_{\mathbf{k}} \cdot \mathbf{k} = 0$$

If ($\mathcal{P}_{\mathbf{k}} = \text{proj. on plane orth. to } \mathbf{k}$), **NS equation** is :

$$\dot{\mathbf{u}}_{\mathbf{k}} = -i \sum_{\mathbf{k}_1 + \mathbf{k}_2 = \mathbf{k}} (\mathbf{u}_{\mathbf{k}_1} \cdot \mathbf{k}_2) \mathcal{P}_{\mathbf{k}} \mathbf{u}_{\mathbf{k}_2} - \nu \mathbf{k}^2 \mathbf{u}_{\mathbf{k}} + f_{\mathbf{k}} = Q_{\mathbf{k}}(\mathbf{u}) - \nu \mathbf{k}^2 \mathbf{u}_{\mathbf{k}} + f_{\mathbf{k}}$$

and the divergence is $div = -\nu \sum_{\mathbf{k}} \mathbf{k}^2 < 0$.

Actually $div = -\infty$ and, for this reason, the eq will be “regularized” by restricting all \mathbf{k} 's to be $|\mathbf{k}| < N$, turning Q into Q^N **and** the problem into studying properties of the reg. solutions **which become** N -indep. as $N \rightarrow \infty$.

Phase space contraction, always accompanying dissipation, **implies** that probabilities describing stationary states **must be concentrated on sets of 0-volume**: hence averages cannot be expressed by volume integrals.

So the basic B.'s assumption that **averages of observables O** could be expressed via integrals $\int O(\vec{p}, \vec{q})\rho(\vec{p}, \vec{q})d\vec{p}d\vec{q}$ cannot be accepted, at least not for all O , in nonequilibrium.

New idea has been that in Physics systems are studied following evolution of samples generated by some “**protocol**”. The procedure, even if carefully built is subject to unknown influences so that the probability distrib P_0 **of the data produced is unknown**.

It has been proposed that it be $P_0 = \rho_0(\vec{p}, \vec{q})d\vec{p}d\vec{q}$ with ρ_0 **continuous but unknown**.

This is a very strong assumption (although **some may consider it not an assumption** at all).

Surprisingly, in systems with **chaotic evolution**, it allows the **unique identification** of the invariant probability distribution **P** for averages of the observables. [6, 7].

It is **only** necessary to interpret **chaotic evolution** in terms of the paradigm offered, in the **elementary dynamical systems** theory for Chaos, by the hyperbolic dynamical systems $x \rightarrow S_t x$.

In such systems following the motion of a point x in phase space one sees it as a **fixed point which is hyperbolic**.

Thus the B. paradigm, identifying periodic motion as the “key”, is replaced by the (equally “disturbing”) paradigm **identifying chaotic systems with hyperbolic systems**.

The main point is that hyperbolic systems are **very well understood**, just as the dynamics of harmonic motions is.

In B.'s case periodic motion assumption was likely to be (in general) mathematically false and yet it generated Stat. Mech., likewise the **hyperbolicity may be false** in most cases of interest: but just like the **periodicity or quasi periodicity** is a paradigm for the ordered motion, so **hyperbolic systems** are the paradigm of chaotic motions.

Hyperbolicity hypothesis opens the way to deriving quite a few physically relevant consequences.

Among B.'s equilibrium results is that the same system can be described by **completely different** probability dist. on phase space: which **nevertheless** attribute the **same average** values to **local** observables, *i.e.* depending on particles located in volumes \ll than the container vol. V .

E.g. investigate again the question of compatibility between **microscopic reversibility** and **macroscopic irreversibility**.

Start remarking that reversibility being a **fundamental symmetry** cannot be lost.

To be concrete consider an **incompressible fluid**, and to further simplify, imagine it in a **periodic container** $[0, 2\pi]^d$, $d = 2, 3$ and subject to a simple “large scale” **stirring force** \mathbf{f} . The NS equation is **again**, $\mathbf{k} \cdot \mathbf{u}_{\mathbf{k}} = \mathbf{0}$ and

$$\dot{\mathbf{u}}_{\mathbf{k}} = Q^N(\mathbf{u})_{\mathbf{k}} - \nu \mathbf{k}^2 \mathbf{u}_{\mathbf{k}} + f_{\mathbf{k}}$$

and the **flow** $t \rightarrow S_t \mathbf{u}$ is **irreversible**: the temperature variable $T(x)$ is absent and the density is constant, which **physically** means that a **thermostat** acts on the system **taking away the heat generated by the stirring**.

It is **phenomenologically** represented by the viscosity term $-\nu \mathbf{k}^2 \mathbf{u}_{\mathbf{k}}$ and the stationary states of the fluid **are a family** \mathcal{P}^{irr} **of probability distributions** \mathbf{P}_{ν}^N on the velocity fields, parameterized by the **viscosity** ν .

However viscosity, being phenomenological, **can be replaced** by other ways of thermostating the fluid: for instance instead of **adding to the Euler equations** the viscous force $-\nu \mathbf{k}^2 \mathbf{u}_{\mathbf{k}}$ to avoid blow up, one could add to Euler eq. a **force which keeps exactly constant** the **“enstrophy”**

$$E(\mathbf{u}) = \sum_{\mathbf{k}} \mathbf{k}^2 |\mathbf{u}_{\mathbf{k}}|^2.$$

This is a non-holonomic constraint that can be generated, **for instance**, by a force determined by Gauss' **least effort principle**: which here amounts to replacing

$$-\nu \mathbf{k}^2 \mathbf{u}_{\mathbf{k}} \Rightarrow -\alpha(\mathbf{u}) \mathbf{k}^2 \mathbf{u}_{\mathbf{k}}$$

From the new viewpoint **one physical system** on which a thermostat acts is governed by **two equations**

$$\dot{\mathbf{u}}_{\mathbf{k}} = Q(\mathbf{u})_{\mathbf{k}}^N - \begin{cases} \nu \mathbf{k}^2 \mathbf{u}_{\mathbf{k}} \\ \alpha(\mathbf{u}) \mathbf{k}^2 \mathbf{u}_{\mathbf{k}} \end{cases} + f_{\mathbf{k}}$$

An elementary application of Gauss' p. yields in $d = 2$

$$\alpha(\mathbf{u}) = \frac{\sum_{\mathbf{k}} \mathbf{k}^2 \mathbf{f}_{-\mathbf{k}} \cdot \mathbf{u}_{\mathbf{k}}}{\sum_{\mathbf{k}} \mathbf{k}^4 |\mathbf{u}_{\mathbf{k}}|^2}$$

Imposing that the stirring does not heat the incompressible fluid can be achieved **either by a phenom. friction** force or by **a force keeping $\mathcal{D}(\mathbf{u}) = \sum_{\mathbf{k}} \mathbf{k}^2 |\mathbf{u}_{\mathbf{k}}|^2$ constant**, which amounts to a **variable friction**. *I.e.* friction is not fundamental.

Of course one can envisage other ways to balance stirring and heating. For instance the **Enstrophy** constraint could be replaced by the constraint of constant **Energy**.

If this is correct we have two equations for the same system: only possibility is their **equivalence**.

Remark that while the first flow, $t \rightarrow S_t^{irr} \mathbf{u}$ is **irreversible**, *i.e.* the **time reversal symmetry** $I\mathbf{u} = -\mathbf{u}$ is such that $IS_t^{irr} \neq S_{-t}^{irr}I$, the second is **reversible** because $\alpha(\mathbf{u})$ is odd:
 $IS_t^{rev} \equiv S_{-t}^{rev}I$

Hence the stationary states of the fluid will be described by **two collection of stationary prob. distr.** Context suggests **strong analogy** with equil. Stat. Mech.:

- **a cut-off N** : analog to container volume V of a gas.
- **a parameter ν** , which parameterizes the stationary distrib. $\mathbf{P}_{\nu}^{irr,N}$ of the irreversible equation analogous to the parameter β in the canonical ensemble
- **a parameter E** which parameterizes the stationary distrib. $\tilde{\mathbf{P}}_E^{rev,N}$ of the reversible equation analogous to the parameter E in the microcanonical ensemble

To check the possibility that the same system could be described by different equations it remains to identify the class of observables with equal averages in corresponding ensembles and the correspondence $E \longleftrightarrow \nu$:

- **observables** will be $O(\mathbf{u})$ which depend on finitely many Fourier comp. $\mathbf{u}_{\mathbf{k}}$: analogous to the observables depending on the particles in a **finite subvolume** $\Lambda \subset V$
- **correspondence** is established by the relation

$$\mathbf{P}_{\nu}^{irr,N} \left(\sum_{\mathbf{k}} \mathbf{k}^2 |\mathbf{u}_{\mathbf{k}}|^2 \right) = E \quad *$$

Then the **precise conjecture** is: * implies

$$\lim_{N \rightarrow \infty} \mathbf{P}_{\nu}^{irr,N}(O) = \lim_{N \rightarrow \infty} \tilde{\mathbf{P}}_E^{rev,N}(O)$$

This means that in a fluid, dissipation can be modeled

1) either via a **viscosity force**:

$$\dot{\mathbf{u}}_{\mathbf{k}} = -Q(\mathbf{u})_{\mathbf{k}} - \nu \mathbf{k}^2 \mathbf{u}_{\mathbf{k}} + \mathbf{f}_{\mathbf{k}}$$

2) or requiring the **enstrophy $\mathcal{D}(\mathbf{u})$ to remain constant**

$$\dot{\mathbf{u}}_{\mathbf{k}} = -Q(\mathbf{u})_{\mathbf{k}} - \alpha(\mathbf{u}) \mathbf{k}^2 \mathbf{u}_{\mathbf{k}} + \mathbf{f}_{\mathbf{k}}$$

The conjecture is being tested and the results of the first few tests are reported in the following graphs.

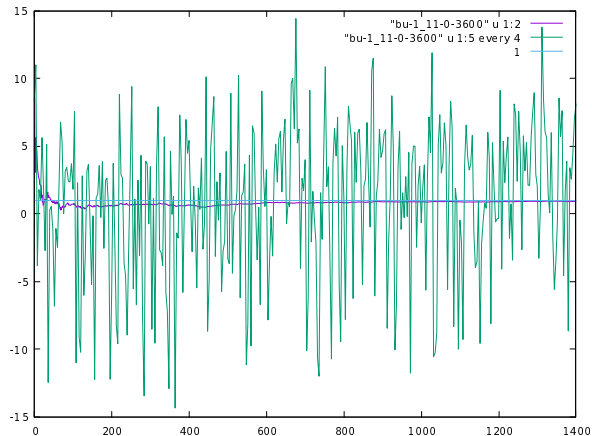
1) tests began from a **rigorous consequence**

$$\tilde{\mathbf{P}}_E^{rev,N}(\alpha) = \nu$$

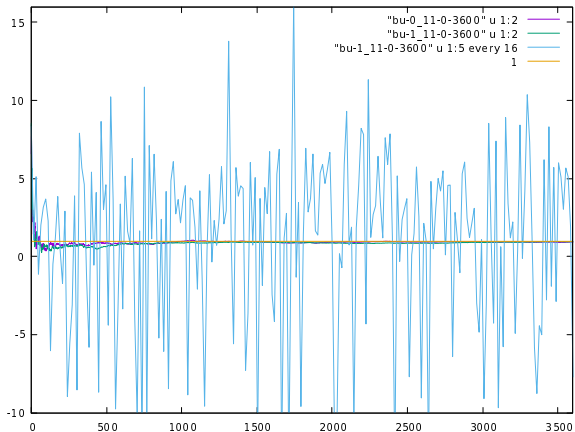
showing conjecture to be about a *homogenization problem*.

2) Then one can take a **special Fourier's component**, like $\text{Re } \mathbf{u}_{2,2}$ and study its average in the two evolutions.

3) extending the conjecture: **Lyapunov spectrum** of two corresponding distr. can be studied



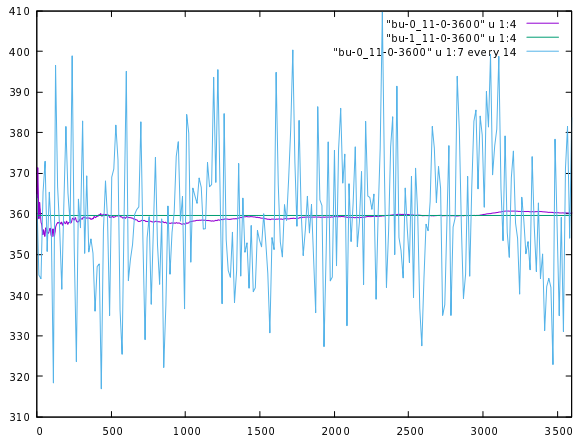
Test of running average of $\nu^{-1}\alpha(\mathbf{u}(t))$ tends to 1: **reversible**
 x-axis= time (unit $\sim \lambda_{max}^{-1}$, step $h = 2^{-17} \sim \frac{1}{4}\lambda_{max}^{-1}$)
 $N = 15$, $\mathcal{N} = 960$ -Fourier's components \mathbf{u}_k
green line = running average of the **purple** $\nu^{-1}\alpha(\mathbf{u}(t))$
blue= line 1



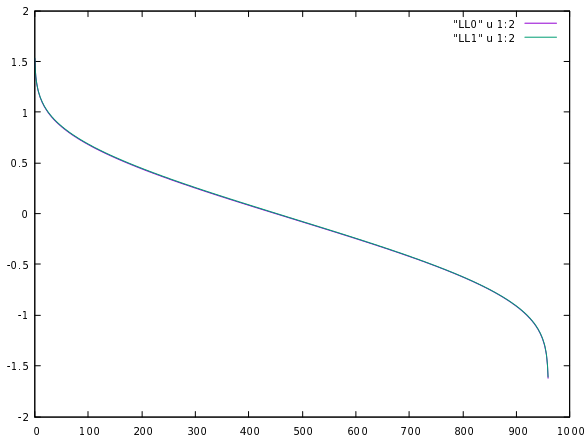
Same reversible: evolution over longer time

Worcester, 12 April 2019

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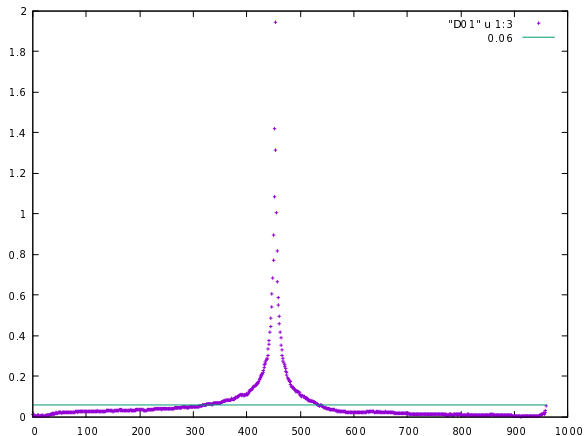


Irreversible evolution: running average of Enstrophy **brown**
and the equivalent Enstrophy in the reversible evol.
straight line blue fluctuating Enstrophy **blue**



Reversible and irreversible local Lyapunov spectra (960 modes, ...)

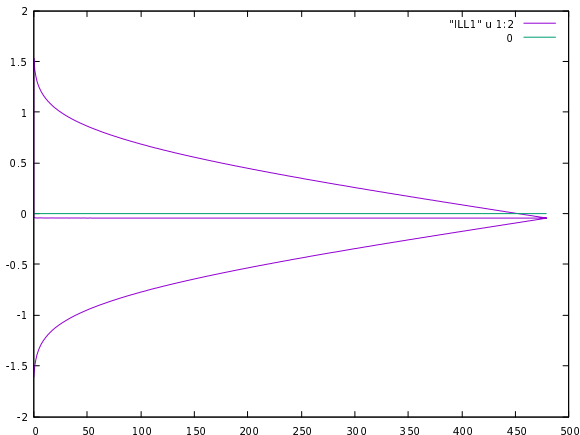
the lines consist of $\mathcal{N} = 960$ data and look superposed



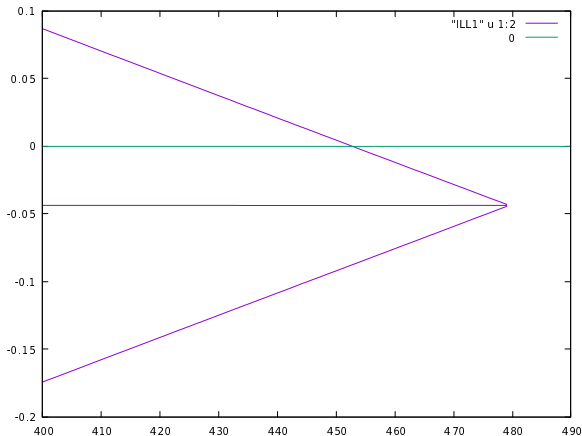
Relative difference of the previous graph:

$$k \rightarrow \frac{|\lambda_k^{rev} - \lambda_k^{irr}|}{\max(|\lambda_k^{rev}|, |\lambda_k^{irr}|)}$$

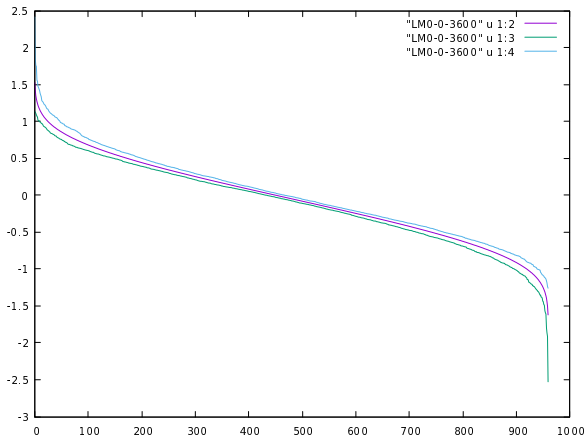
The line marks **6%**.



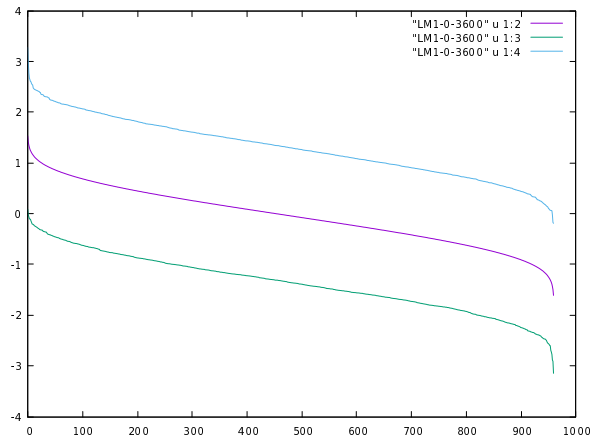
Lyapunov exp. of the previous drawing, $\mathcal{N} = 960$ drawn differently (first $\frac{1}{2}\mathcal{N}$ λ_k 's followed by the next as $\lambda_{\mathcal{N}-1-k}$ $k \rightarrow \frac{1}{2}(\lambda_k + \lambda_{\mathcal{N}-1-k})$ **violet** (looks straight but is not)
 This illustrates the (approximate) **pairing rule** (**irreversible evol:** but reversible gives same graph).



Detail: illustrates presence of a **fraction of pairs < 0** :
 interpretation (tentative): exponents relative to the
 approach to the attractor. If so the Kaplan Yorke fractal
 dimension should **discard** them from the count.



Irreversible exponents: the violet line is the above irreversible spectrum, equal to the reversible. The other two lines are the envelopes of the maximal and minimal values averaging to the central line (*i.e.* “error estimate”)



Reversible exponents: the **violet** line is the above reversible spectrum **apparently equal** to the irreversible one. The other two lines are the envelop of the **maximal and minimal** values averaging to the central line (*i.e.* “error estimate”).
Very strong fluctuations but coinciding averages

Quoted references

- [1] S. Carnot.
Réflexions sur la puissance motrice du feu et sur les machines propres à développer cette puissance.
Online in <https://gallica.bnf.fr>; original Bachelier, 1824; reprinted Gabay, 1990., Paris, 1824.
- [2] R. Clausius.
Ueber eine veränderte form des zweiten hauptsatzes der mechanischen wärmetheorie.
Annalen der Physik und Chemie, 93:481–506, 1854.
- [3] R. Clausius.
On the application of the theorem of the equivalence of transformations to interior work.
Philosophical Magazine, 4-XXIV:81–201, 1862.
- [4] R. Clausius.
Über einige für Anwendung bequeme formen der Hauptgleichungen der mechanischen Wärmetheorie.
Annalen der Physik und Chemie, 125:353–401, 1865.
- [5] A. Krönig.
Grundzüge einer Theorie der Gase.
Annalen der Physik und Chemie, XCIX:315–322, 1856.
- [6] R. Bowen and D. Ruelle.
The ergodic theory of axiom A flows.
Inventiones Mathematicae, 29:181–205, 1975.
- [7] Ya.G. Sinai.
Lectures in ergodic theory.
Lecture notes in Mathematics. Princeton University Press, Princeton, 1977.

Also: <http://arxiv.org> & <http://ipparco.roma1.infn.it>